



Interactive Discovery of New Phenomena in Martian Point Spectra and Hyperspectral Data Sets

Kiri L. Wagstaff, Nina Lanza, David R. Thompson,
Diana L. Blaney, and Thomas G. Dietterich

December 3, 2012

Fall Meeting of the American Geophysical Union

This work was carried out in part at the Jet Propulsion Laboratory, California Institute of Technology, © 2012.
Government sponsorship acknowledged. It was also supported by the Defense Advanced Research Projects Agency (DARPA)
under Contract W911NF-11-C-0088. Any opinions, findings, and conclusions or recommendations expressed in this material are
those of the author's and do not necessarily reflect the views of the DARPA, the Army Research Office, or the US government.

Principal Component Analysis

ChemCam calibration data set (n=110, d=6143)

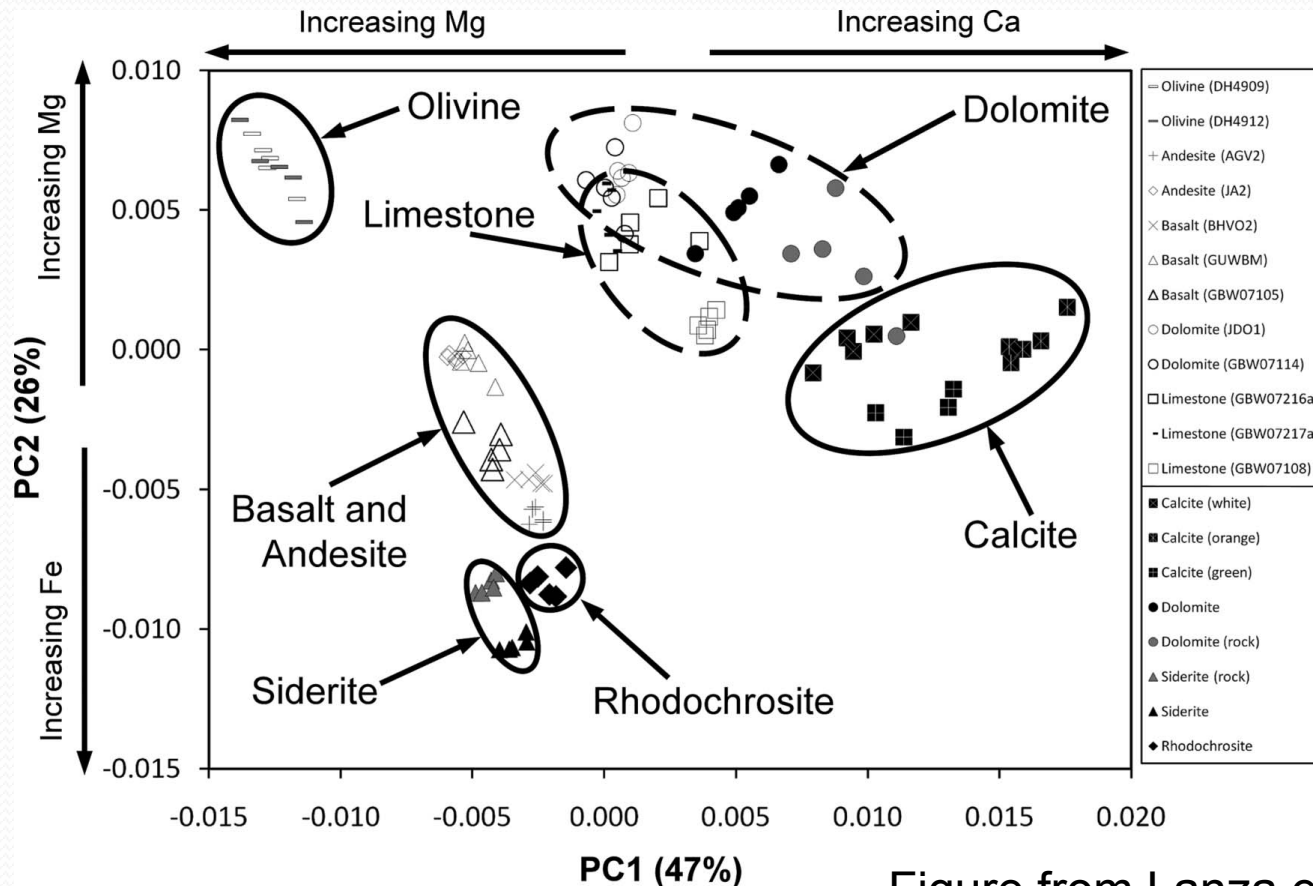
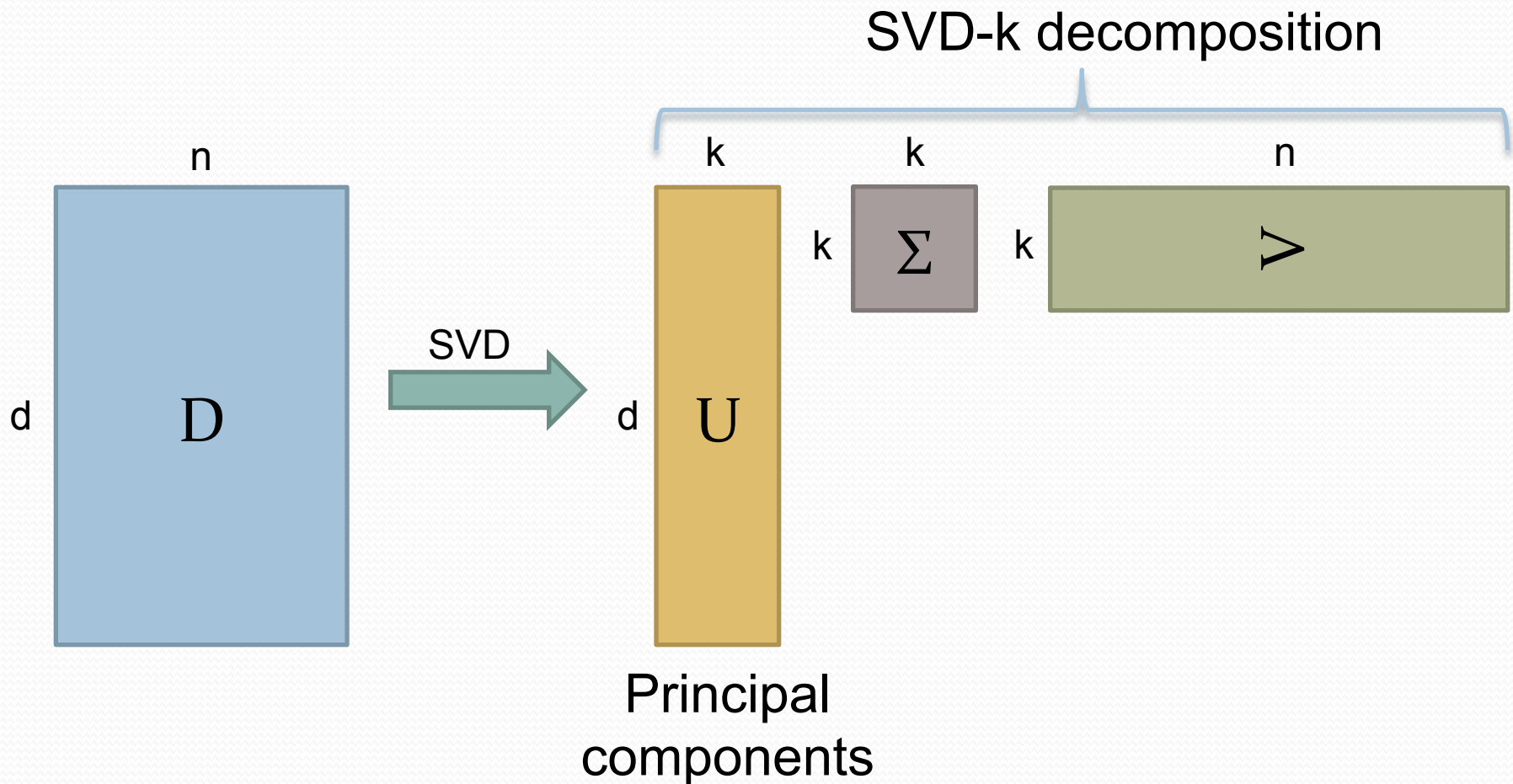


Figure from Lanza et al., 2010

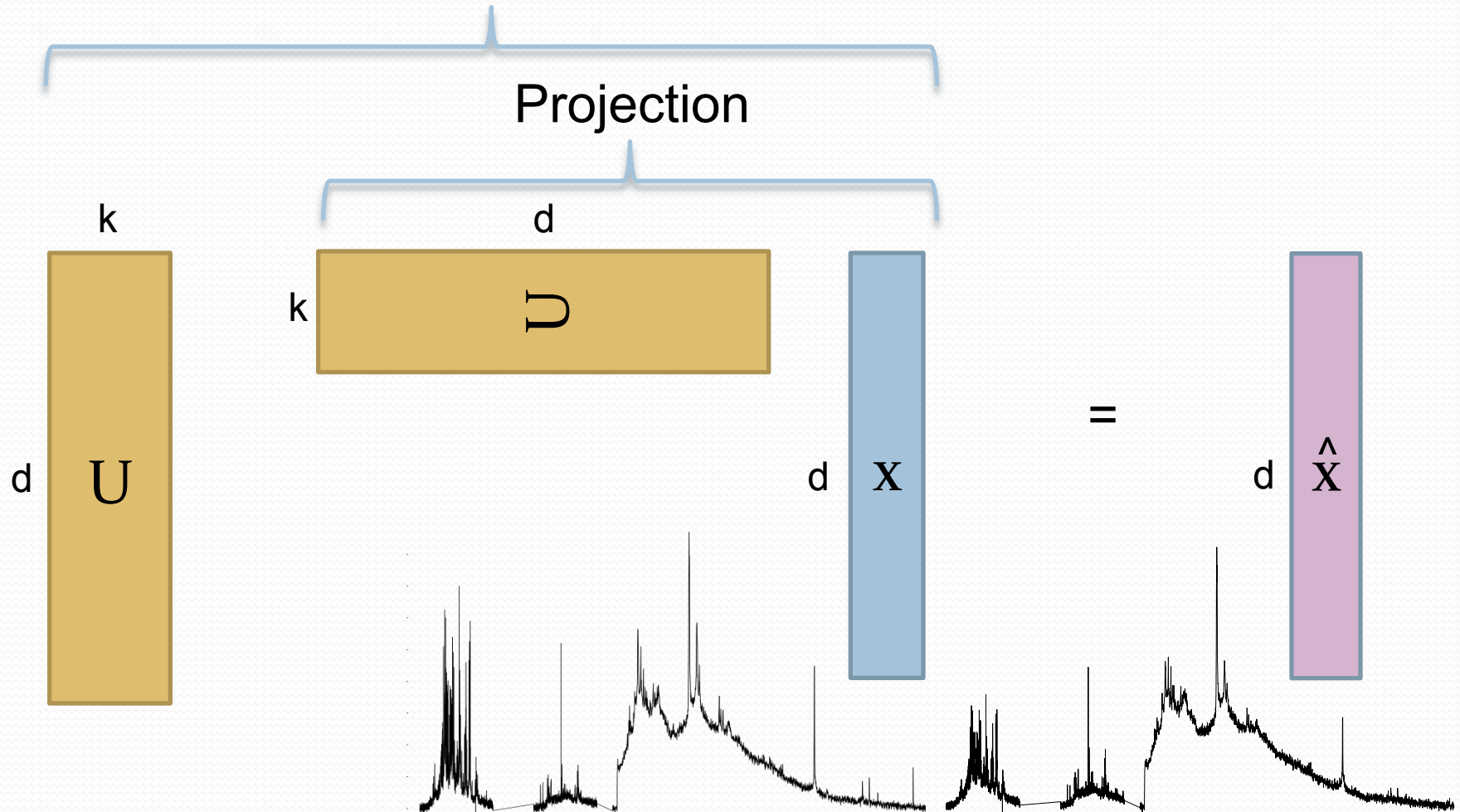
SVD-k truncates PCA to k components



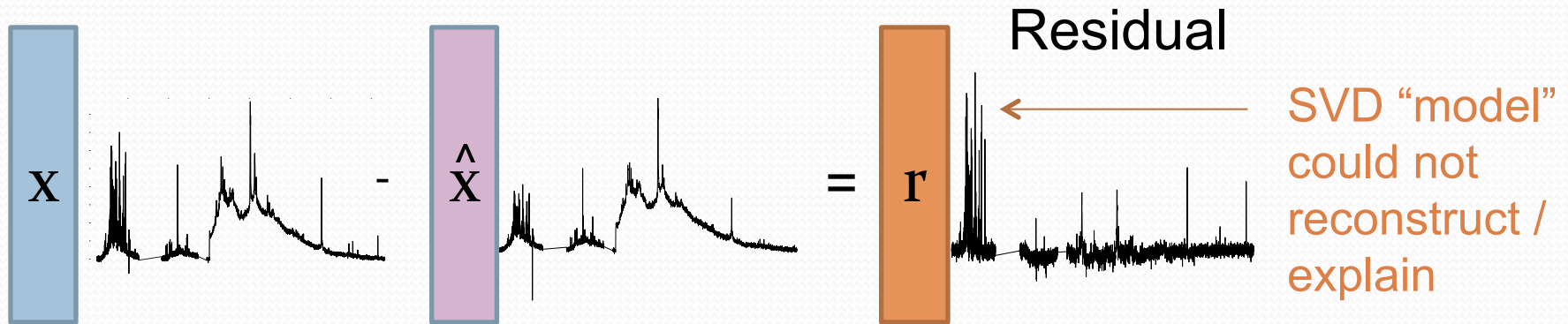
PCs can be used to “explain” data

Reconstruction

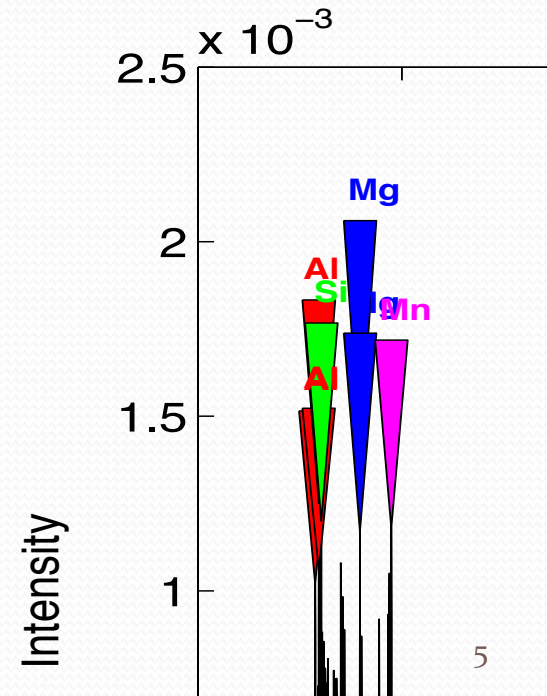
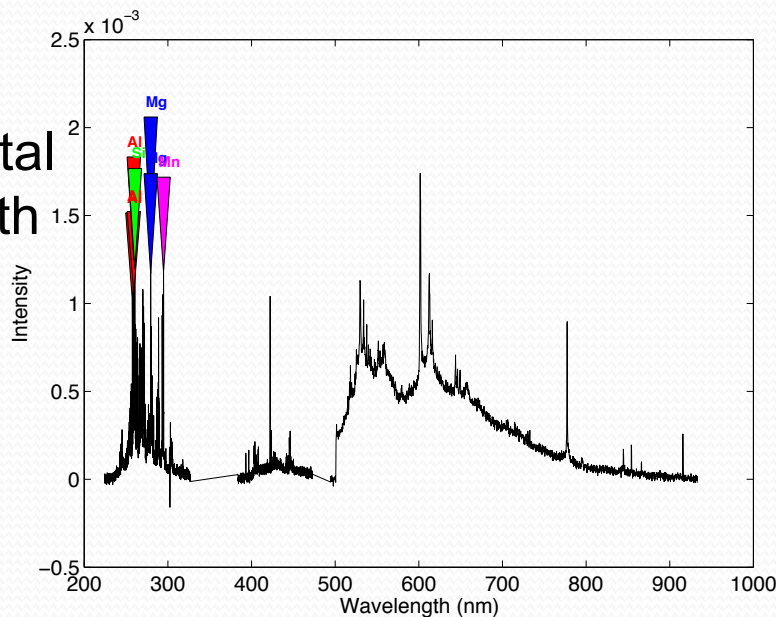
Projection



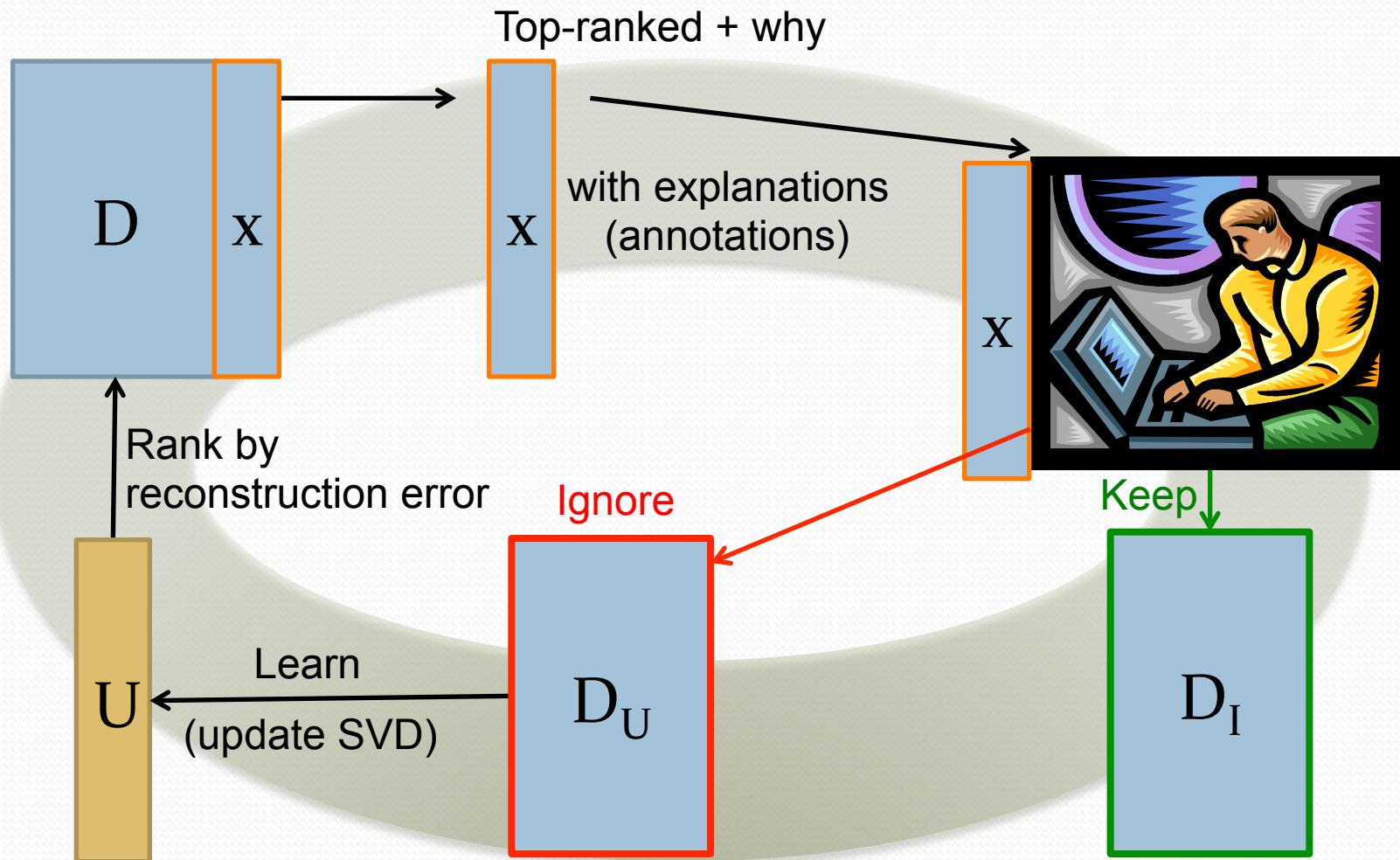
PCs can be used to “explain” data



Annotate elemental emission lines with high residuals:

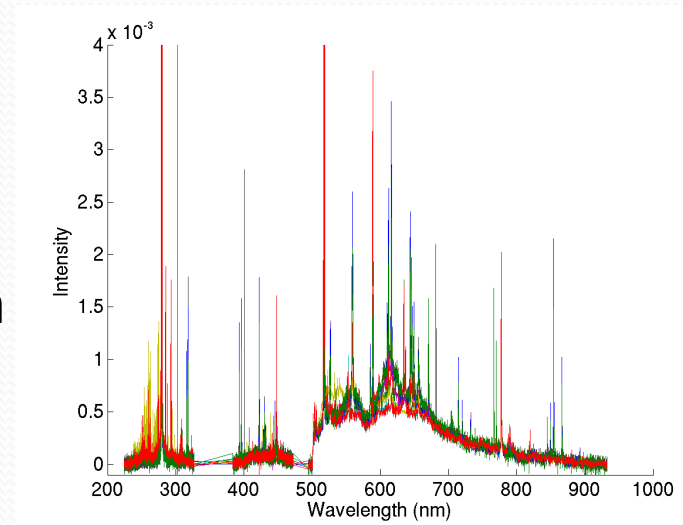


DEMUD: Discovery via Eigenbasis Modeling of Uninteresting Data

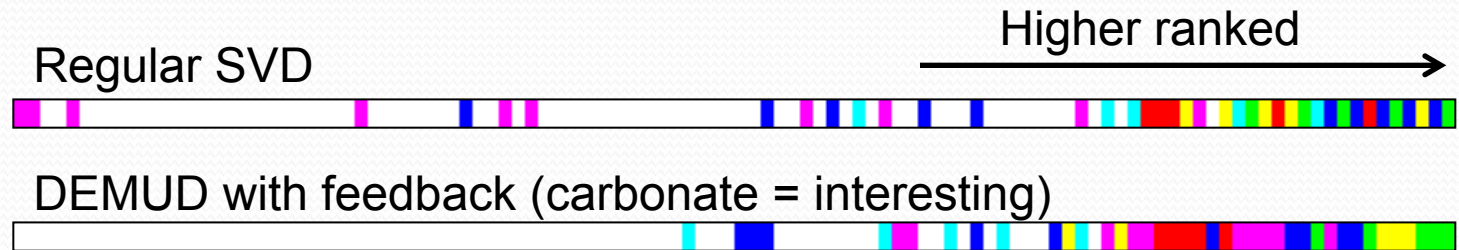


ChemCam: Carbonates

- ChemCam: LIBS instrument on MSL
- Calibration data set:
 - 70 lab standards + 40 carbonates
 - 6143 features (bands) observed with lab spectrometer (not ChemCam)
 - K (8) captures 90% variance



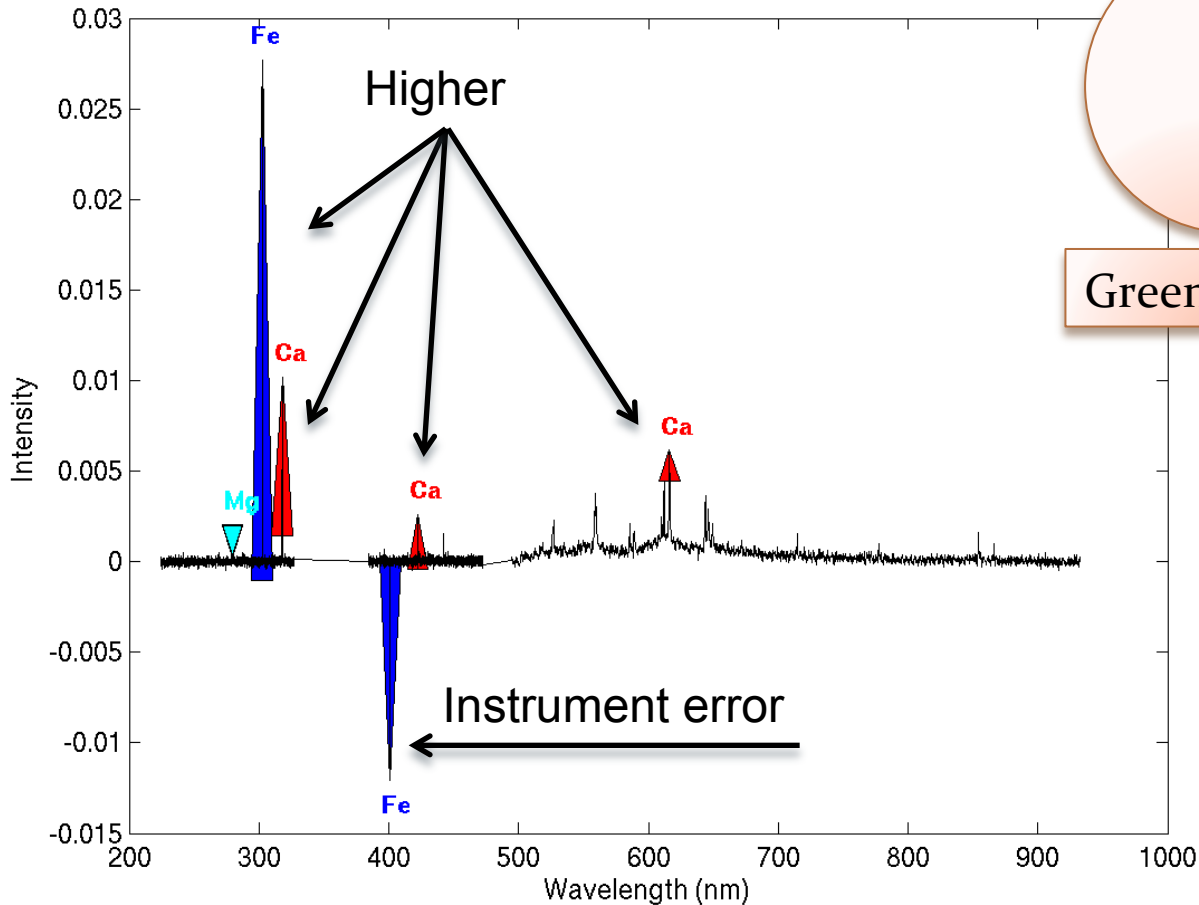
Calcite
 Green calcite
 Orange calcite
 Dolomite
 Rhodochrosite
 Siderite



ChemCam: First selection

Higher than expected

Lower than expected



1

Green Calcite

Legend

Ca

Fe

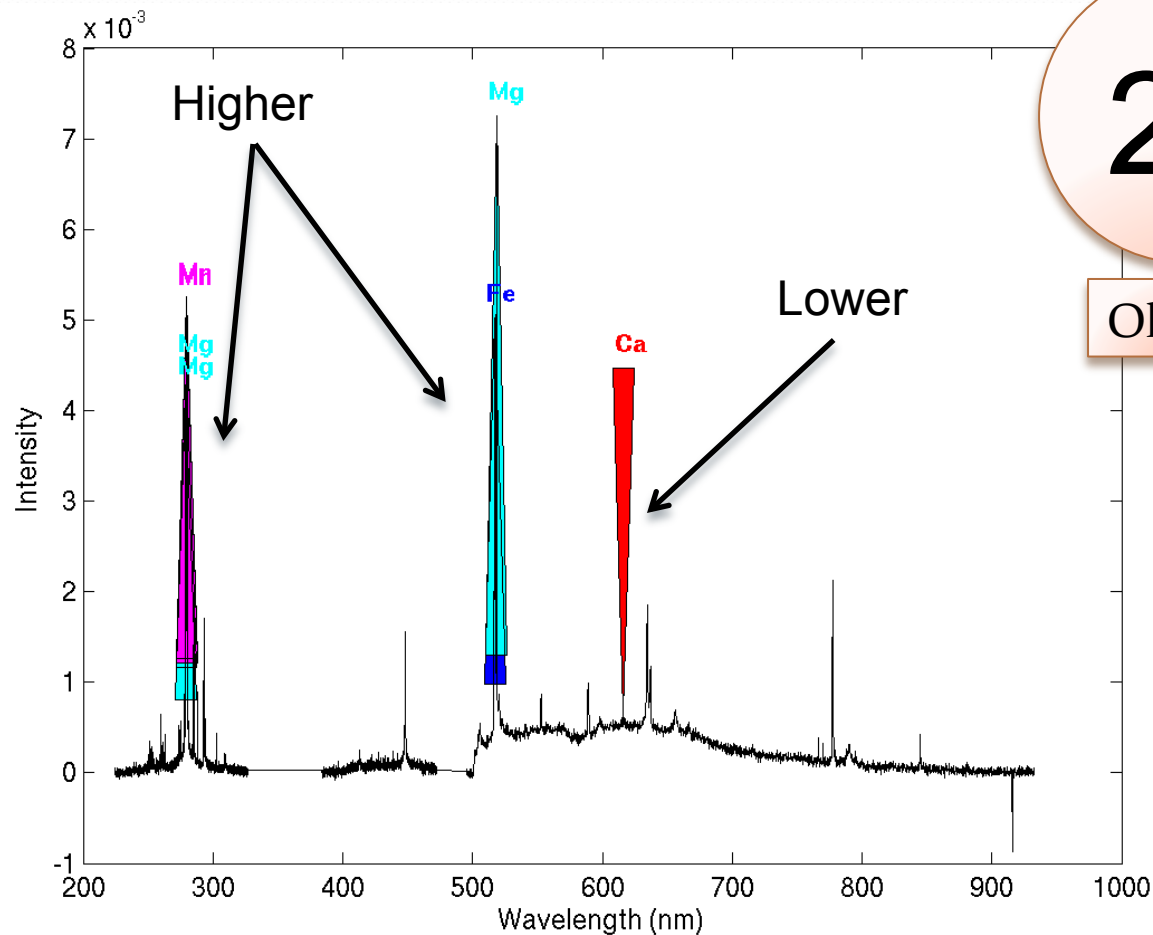
Mg

Mn

ChemCam: First non-carbonate

Higher than expected

Lower than expected



28

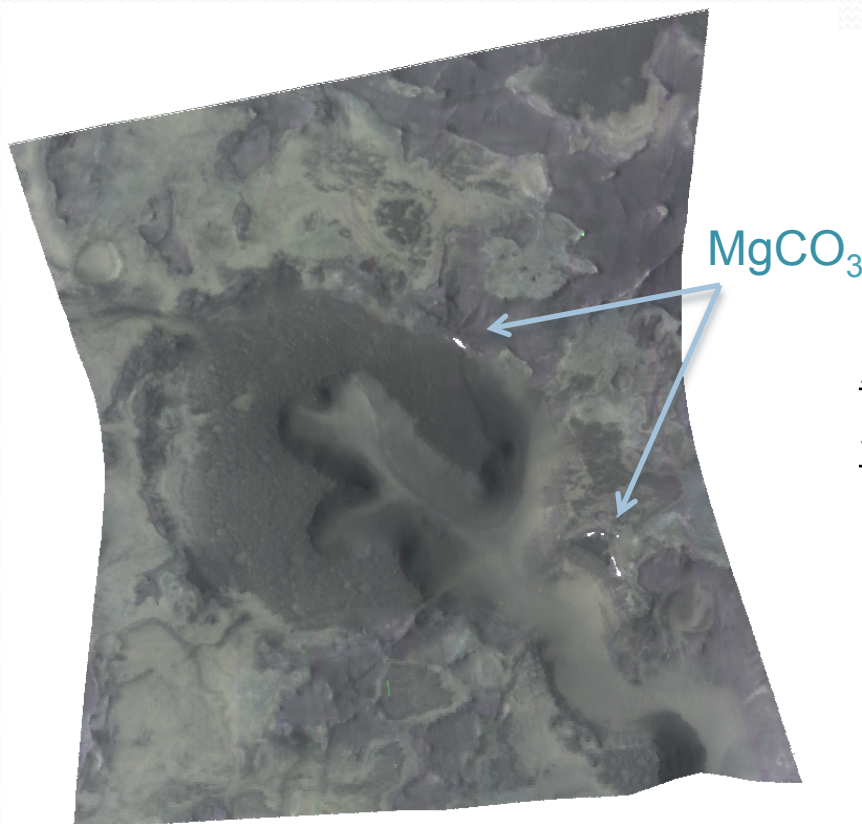
Olivine

Legend

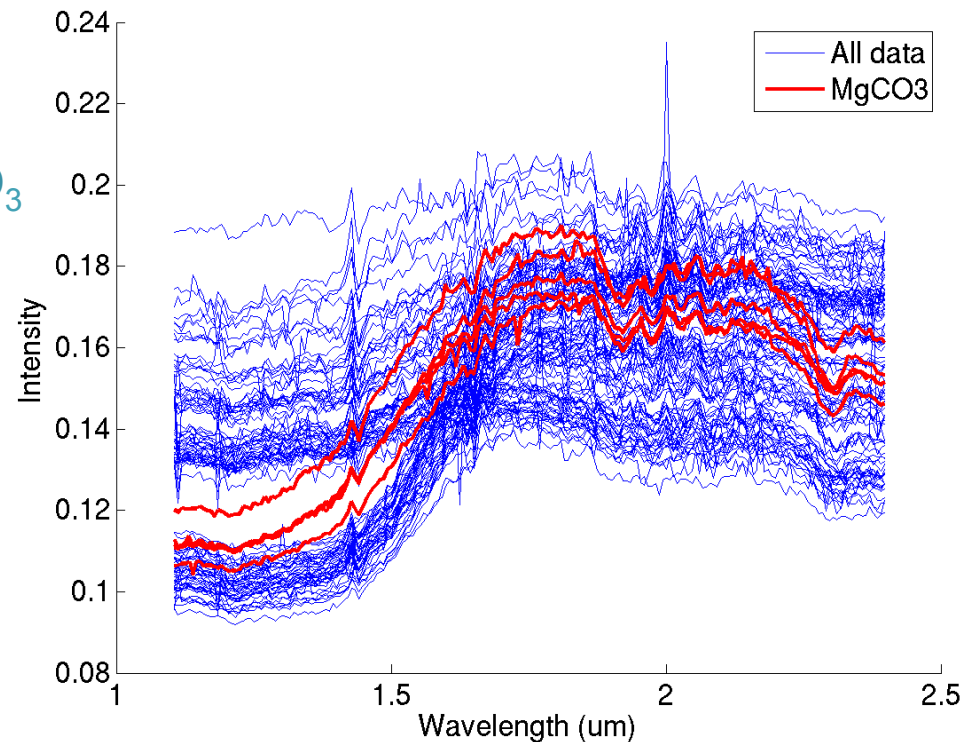
Ca
Fe
Mg
Mn

CRISM: Magnesite discovery

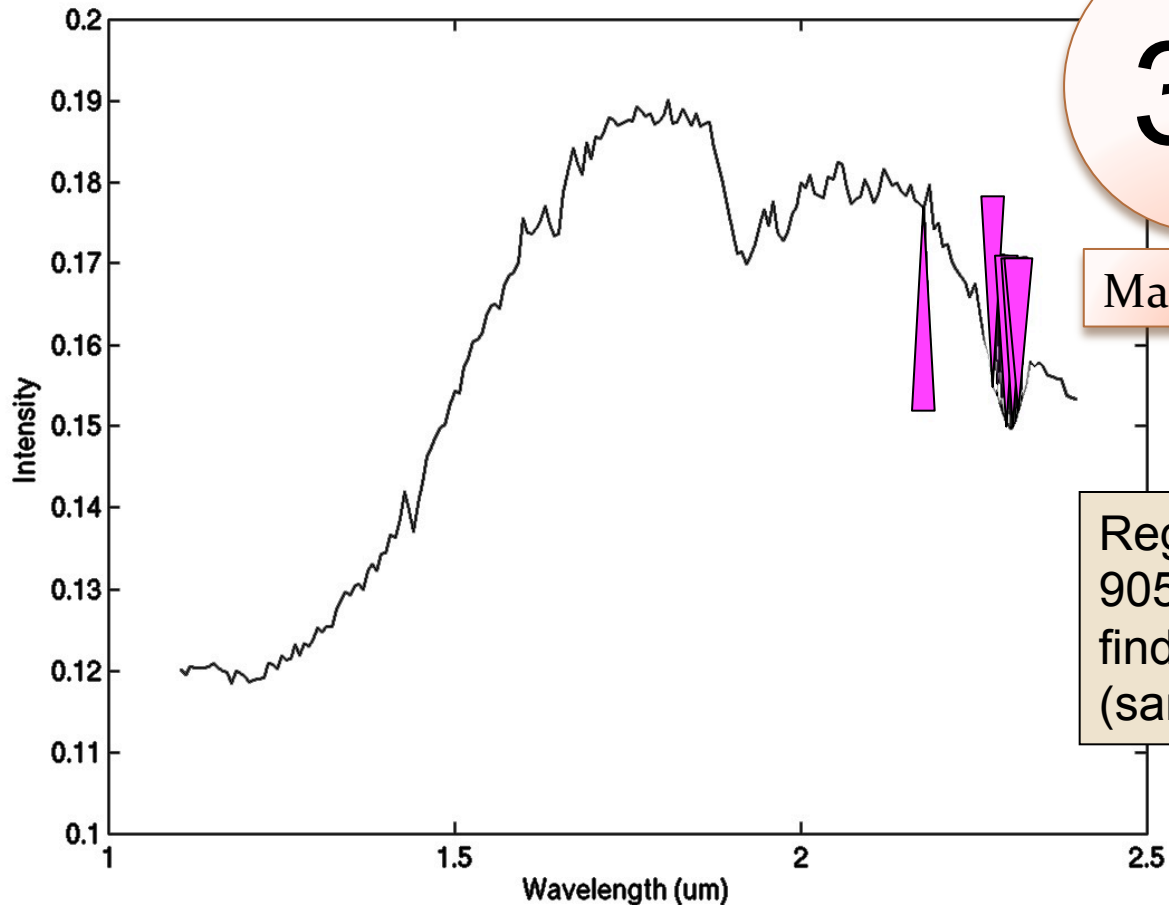
- Magnesite (MgCO_3): possible groundwater deposit
- CRISM data: 0.364 to 3.92 μm , 197 bands
- Nili Fossae: only 17 of 15,400 items match



Random subset of CRISM data



CRISM: First magnesite



Higher than expected

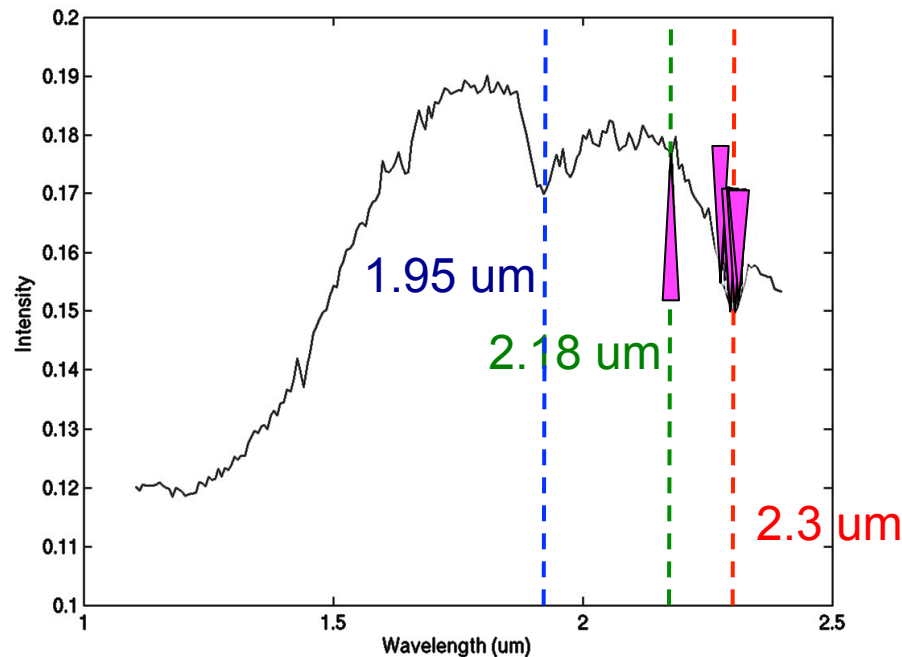
Lower than expected

Magnesite

Regular SVD:
905 queries to
find 1st magnesite
(same as random)

Similar to Gusev findings

Nili Fossae with DEMUD explanations



Gusev: Mg-rich member (~magnesite), plus 1.95-μm hydrous silica mixture?

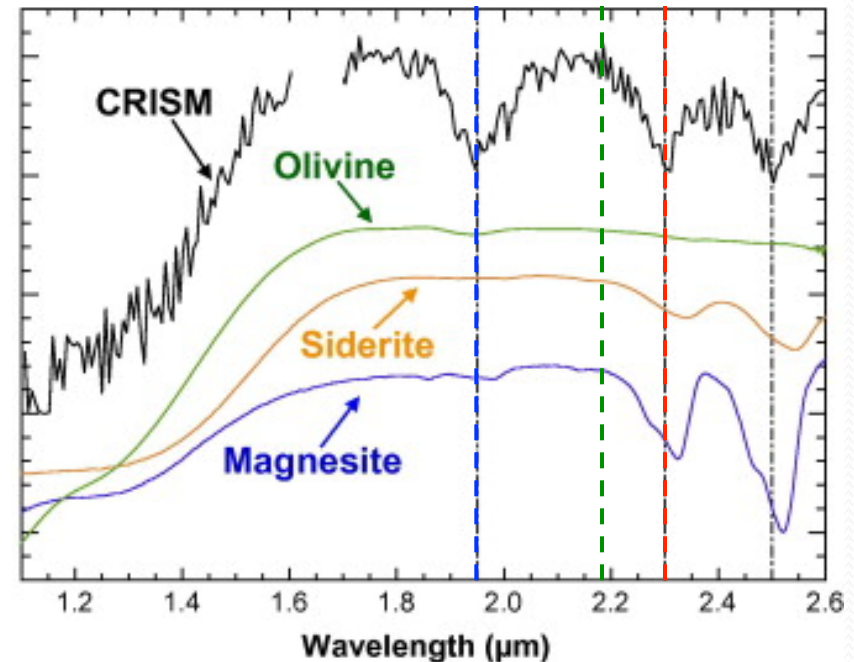


Figure from Carter & Poulet, 2012

Summary

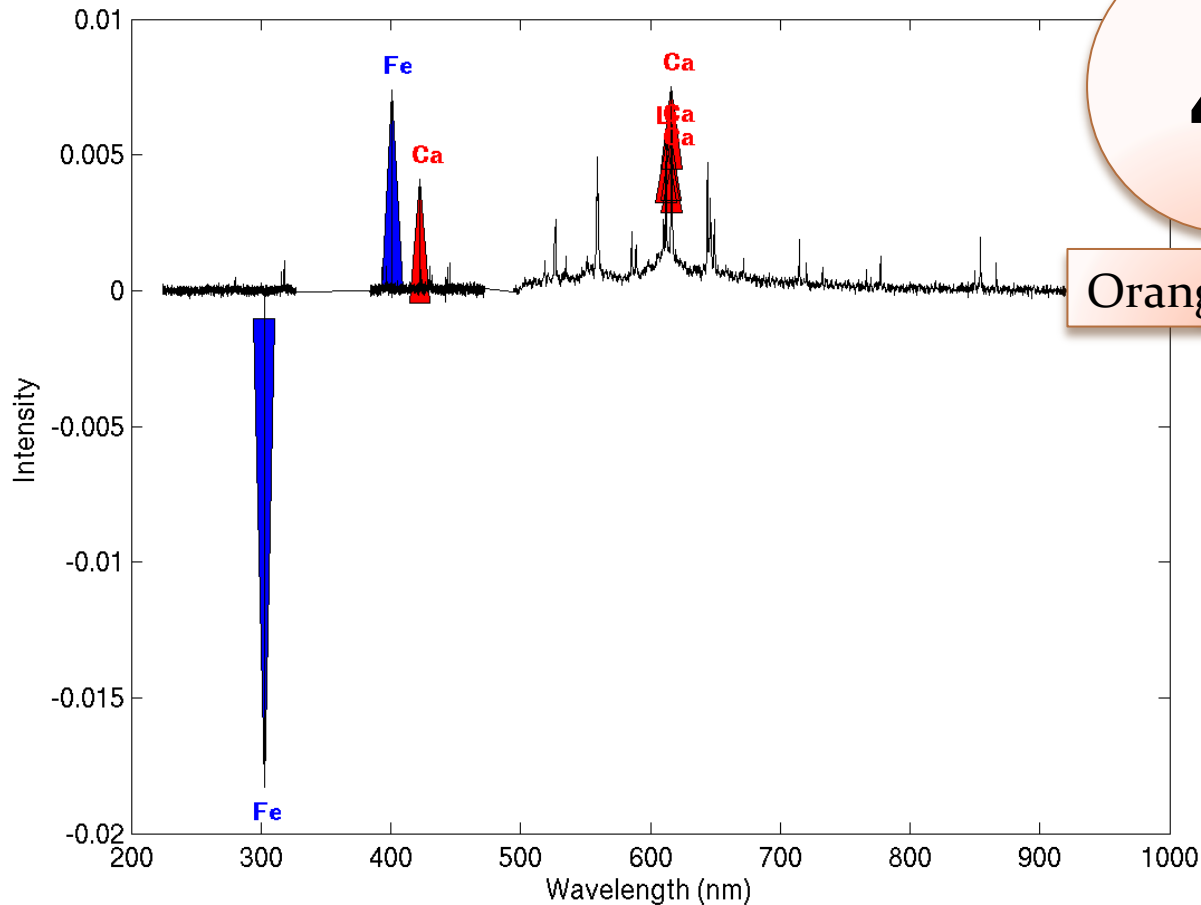
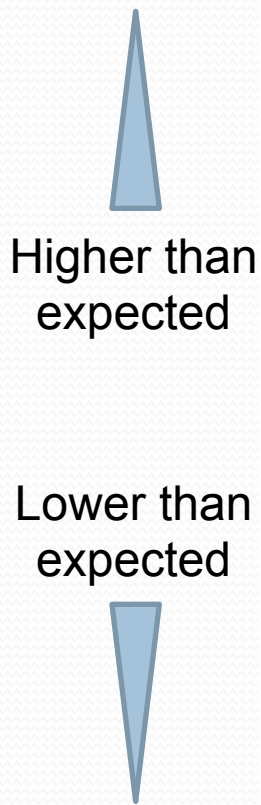
- DEMUD: Interactive discovery in large data sets
 - Adapts to individual feedback / priorities
 - Provides explanations for spectra of interest
- ChemCam calibration data results
 - Found carbonates in half the queries needed by SVD
 - Explanations:
 - Carbonates: ↑Ca, ↓Mg; olivine: ↑Mn, ↑Mg, ↑Fe, ↓Ca
- CRISM: found potential magnesite with just 36 queries of 15,400 candidates and no previous training

Contact: kiri.wagstaff@jpl.nasa.gov



Backup Slides

ChemCam: Explanations



4

Orange Calcite

Legend

Ca

Fe

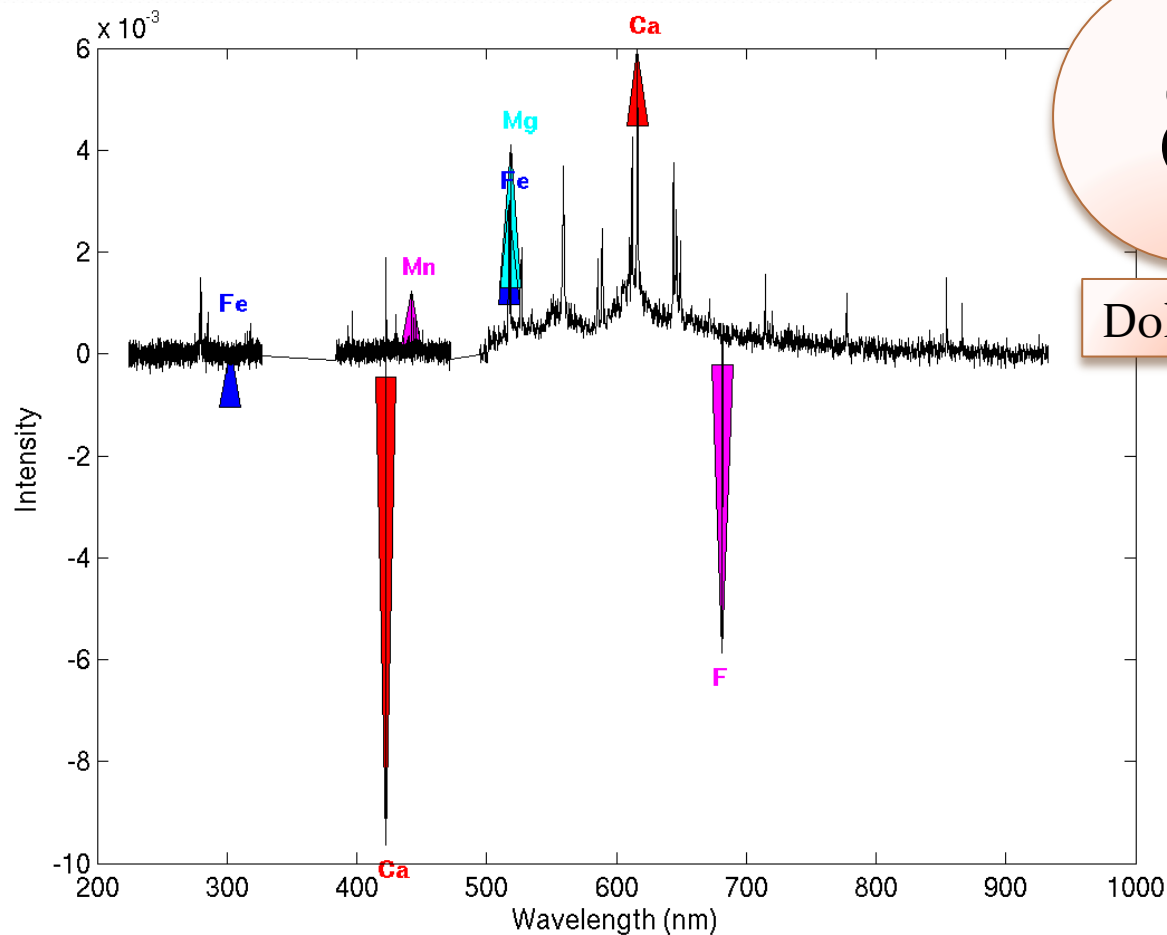
Mg

Mn

ChemCam: Explanations

Higher than expected

Lower than expected



8

Dolomite

Legend

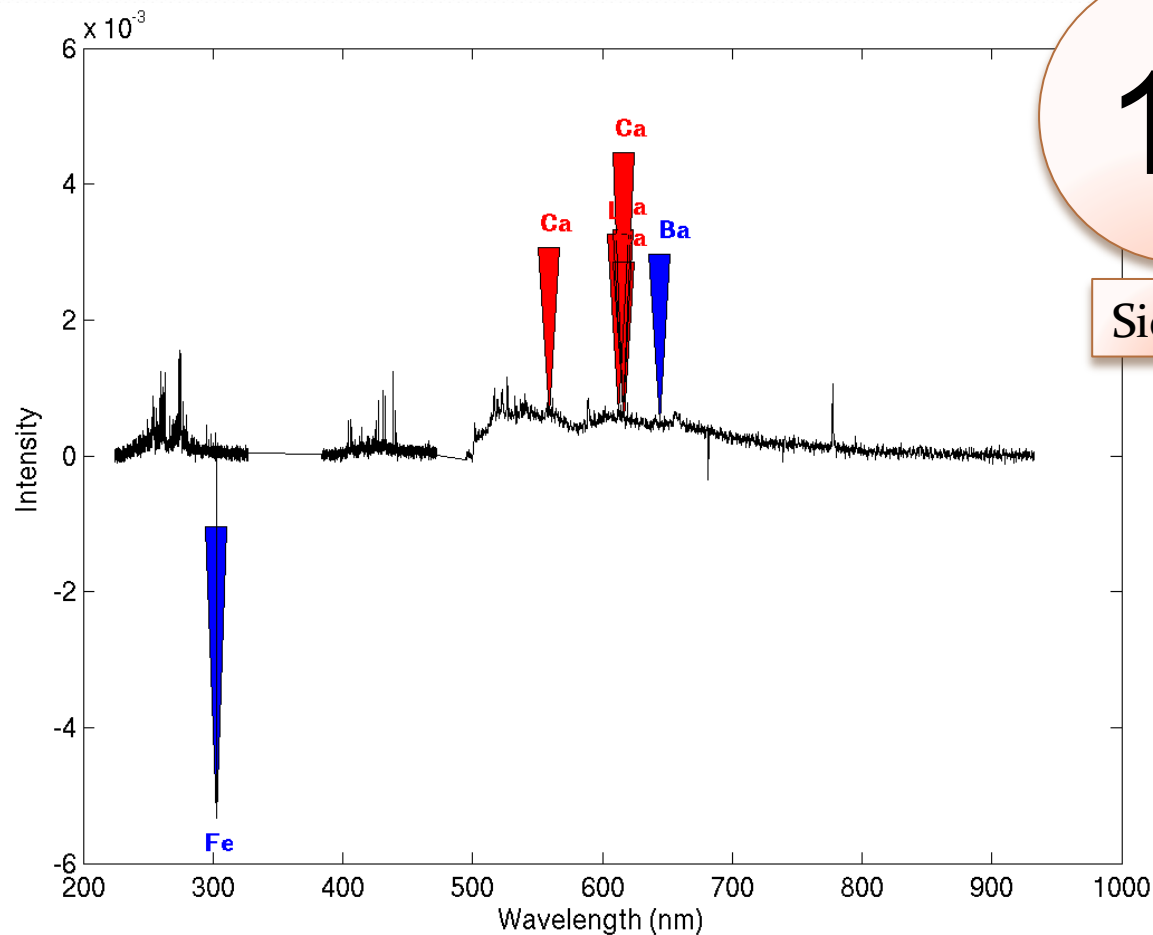
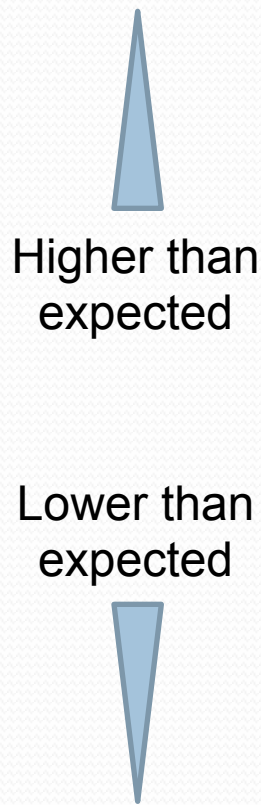
Ca

Fe

Mg

Mn

ChemCam: Explanations



Siderite

Legend

Ca

Fe

Mg

Mn

CRISM: Magnesite Discovery

